



Project Argus:
Eye to the Future

Argus Prime Argus Prime

Adventures with ACT-R 5.0

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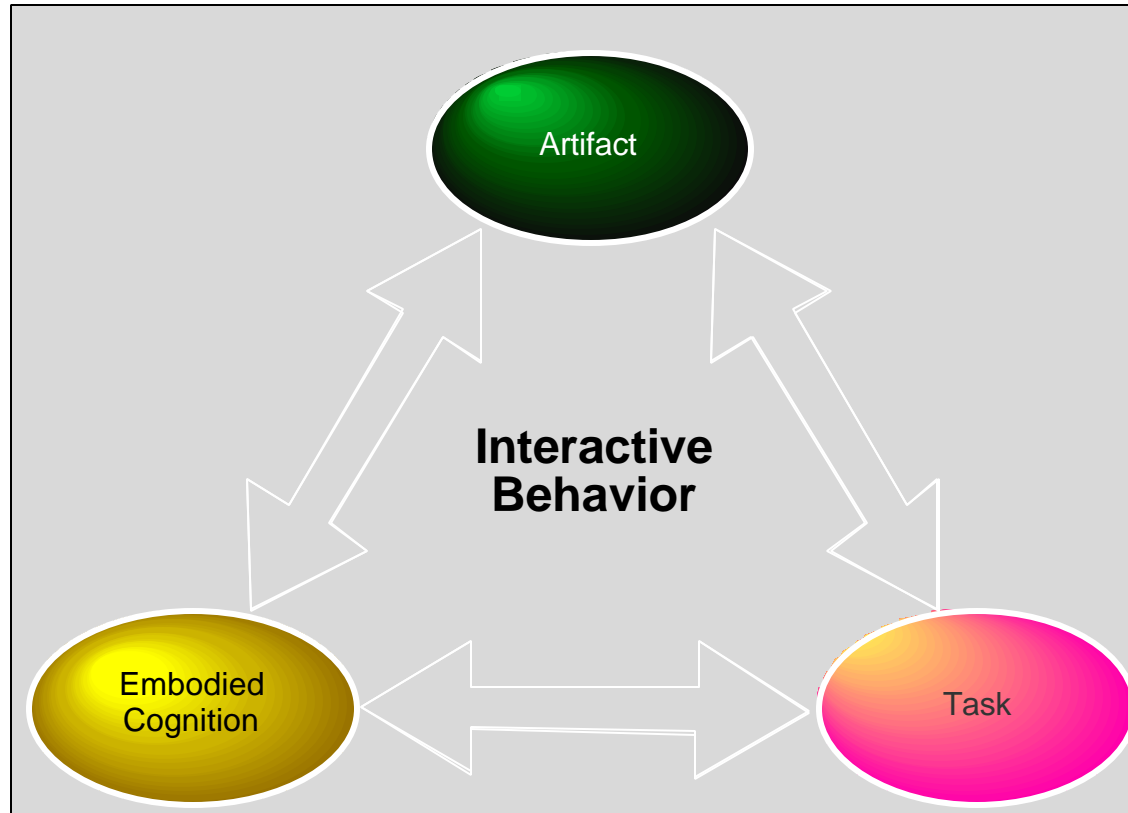
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Goals of This Talk

- Review the Argus Prime Task
- Show matches and mismatches between performance of *Human Subjects* and *Model Subjects*
- Describe the *Model Subjects* written in ACT-R 5.0
 - ◆ Proof of concept that ACT-R 5.0 should be the architecture of choice for complex HCI environments
- Discuss accommodation of *Model Subjects* to
 - ◆ Different interface conditions
 - ◆ User strategies
- Conclude: Engineering Approach to Building and Fitting Models of Interactive Behavior may use ACT-R 5.0 as its basis

Perspective on Interactive Behavior



Argus Task

■ **DEMO**

Data Collection

- **Eye data (60 samples/second)**
- **Mouse data (60 samples/second)**
- **Mouse clicks**
- **Target data**

Playback

■ **Demo**

We Will Discuss Data and Model from Two Studies

■ AP#4

- ◆ No secondary tas
- ◆ 24 human subjects

■ AP#5

- ◆ Secondary tracking task
- ◆ 24 human subjects

- All other interface conditions were the same across studies**

Within-Subject Interface Conditions

■ Dot versus noDot

- ◆ If target was already classified, then when it was reselected its threat value would be shown (with a dot) in the information window

Speed	Range	Bearing	Altitude	Course	AppDist
1200	177	352	38100	105	168

1	2	3	4	5	6	7
<input type="radio"/>	<input type="radio"/>	<input checked="" type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>	<input type="radio"/>
0 - 1	2 - 3	4 - 5	6 - 7	8 - 9	10 - 11	12 - 13

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Within-Subject Interface Conditions

■ Dot versus noDot

◆ Or not (noDot)

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Track Number: **14**

Within-Subject Interface Conditions

■ **Feedback versus no-Feedback**

- ◆ Immediately following classification feedback either was available in a feedback window or was not



MODEL

- **DEMO of one Model Subject doing AP#5**

Why Build Model Subject(s)

■ **Between subject variability**

◆ **Use of interface feature**

- **Help**
- **Feedback**
- **Track Number**
- **Filled in radio button**

◆ **Visual Search Strategies**

◆ **Cognitive operations**

How to Build a Model Subject

- **Dial-A-Human**
- **Parameters of the Model Subject**
- **AP4 --> AP5**

User Parameters

- **User Interface Design**

- ◆ Create a mix that reflects user population

- **User Interface Testing**

- ◆ Set for specific conditions

- **Dial-A-Human implemented by changing the P value of relevant productions**

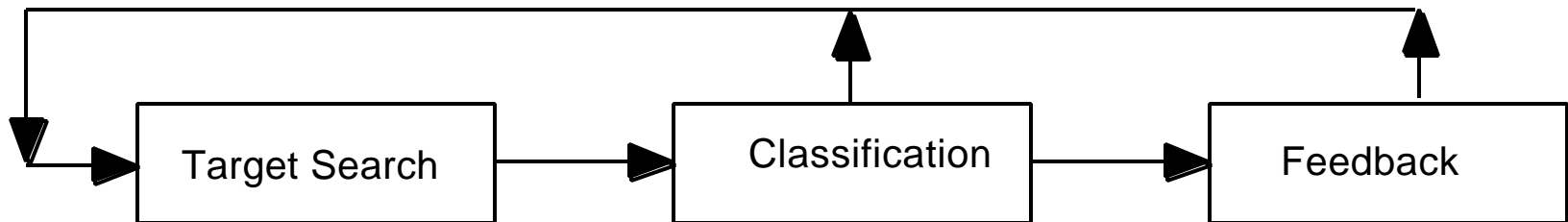
AP4 versus AP5 Model Subjects

- **Single-task AP4 Model Subjects built to be matched to general mix of strategies found in AP4 Human Subjects**
- **Same Model Subjects used in AP5 for dual task**
 - ◆ **+1 parameter for tracking**
 - ◆ **No change to the classification task productions and parameters used by these Model Subjects for AP4**

Modeling Single versus Dual Task Performance

- **AP4 -- Single Task Performance**
- **AP5 -- Dual Task Performance**
 - ◆ **Interleaving of Tracking with Classification Task**

Argus Unit Tasks - single task



Dual Task Environment

- **Tracking task**

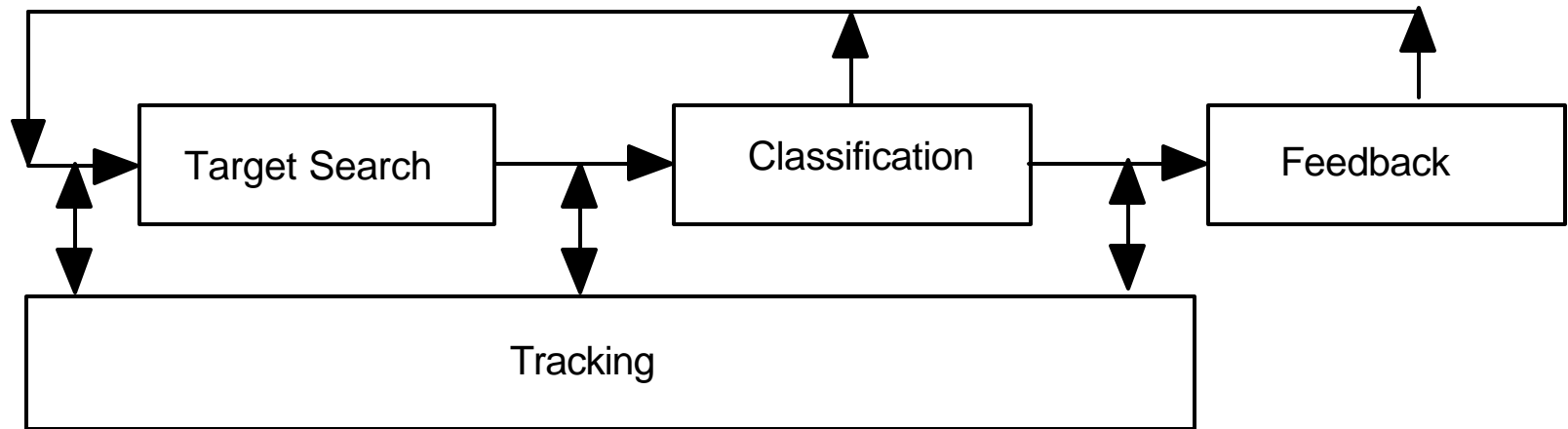
- ◆ A perceptual/motor task
- ◆ Increase workload

- **Can model predict degradation of performance on primary task in dual task condition?**

- **Used same Model Subjects**

Tracking Unit Task

- The model switches to the tracking task at unit task boundaries



Tracking Unit Task

- **During the Classification task, the Model checks, between unit tasks, to determine whether it should switch to the tracking task**
- **Tests to determine**
 - ◆ **If the tracking cursor has changed color (blue to yellow or to red)**
 - ◆ **Difference in score between classification task and tracking task**
- **Stays switched until tracking cursor changes back to blue**

Characteristics of Computational Models of Embodied Cognition in a Dynamic Task

- Production counts
- Production Firings
- Buffer actions
- Declarative Memory Elements created as the Model Subject performs a scenario
- Hot off the press results, to provide a flavor of the complexity of the model, not (yet) as a detailed comparison between model runs of AP4 versus AP5

Model Structure

■ **243 Productions**

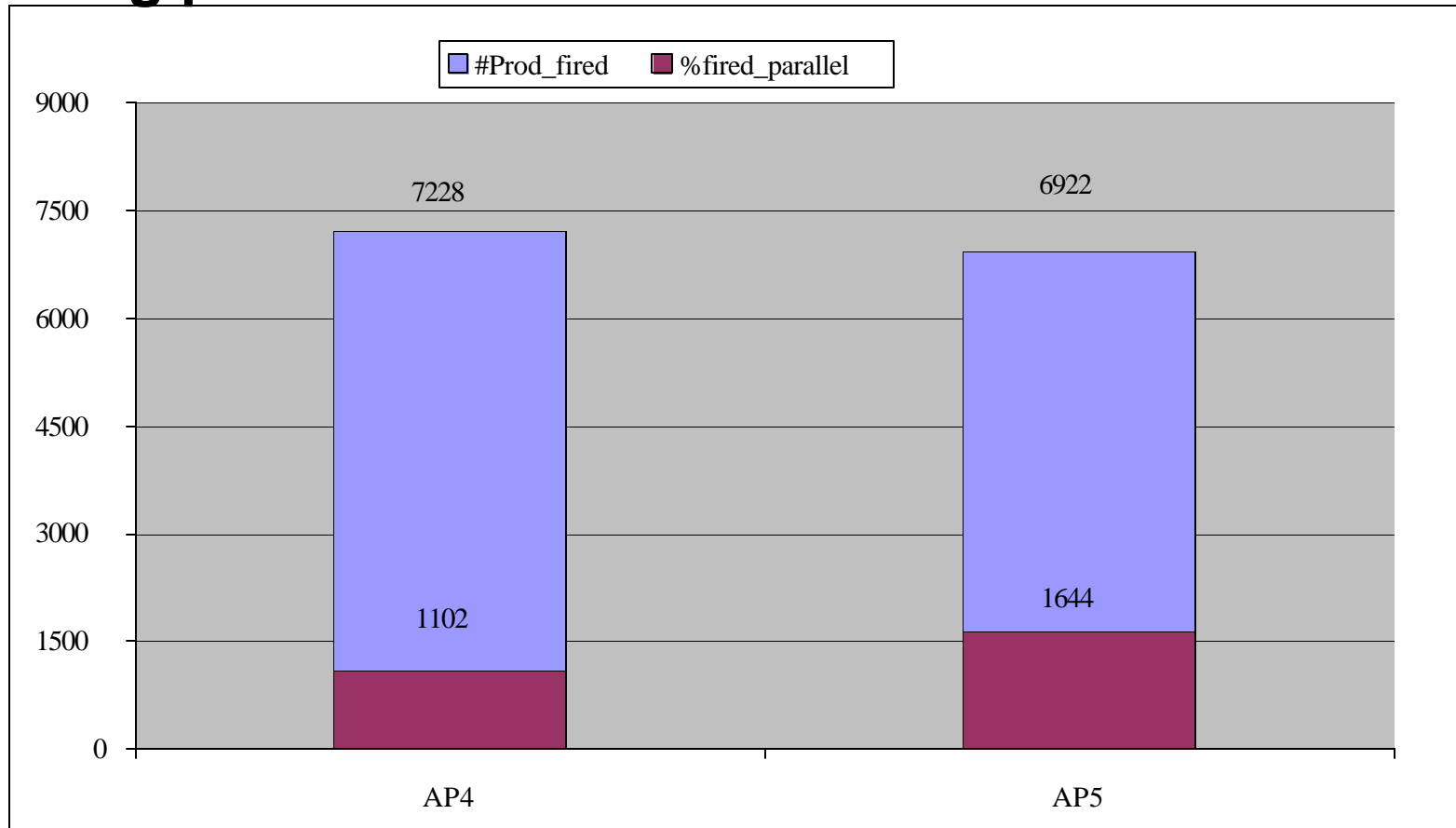
- ◆ **96 change the goal buffer**
- ◆ **61 retrievals**
- ◆ **43 feature search**
- ◆ **22 attention shifts**
- ◆ **33 motor operations**

■ **33 productions initiate parallel operations**

- ◆ **2 buffer changes on RHS**

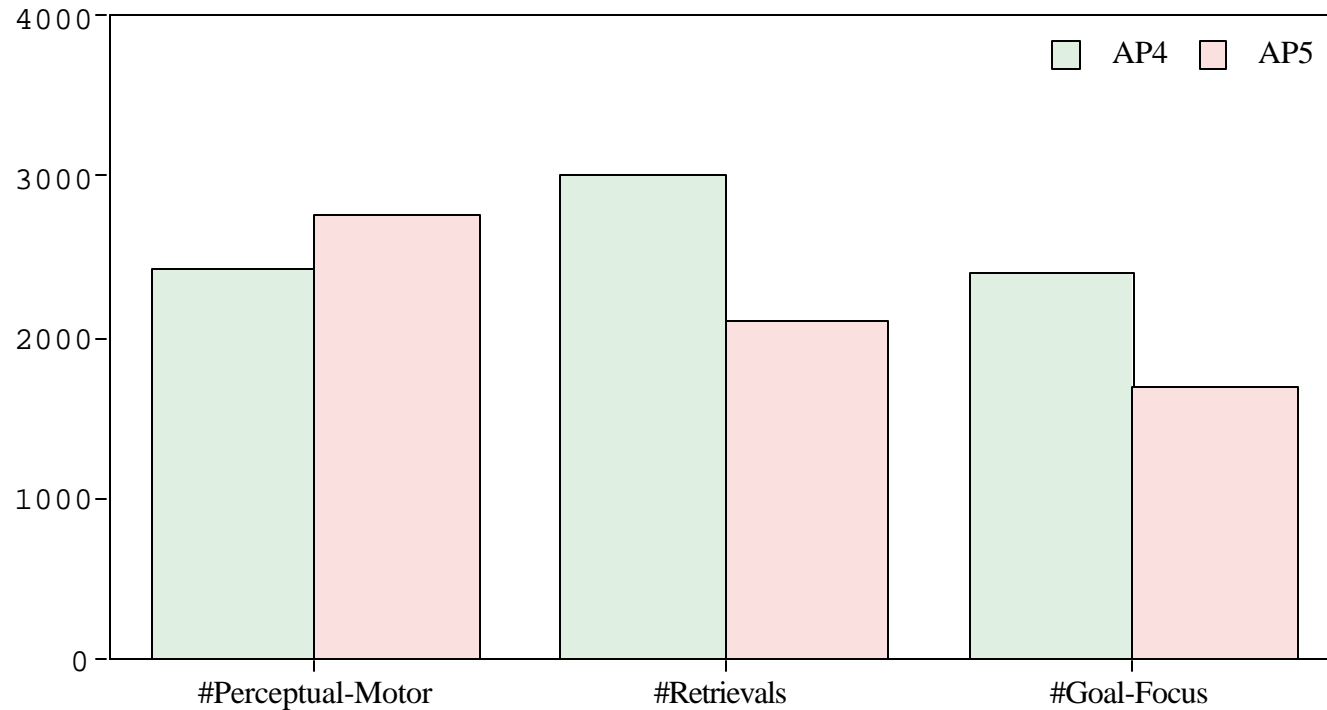
Model Execution

- Mean number productions fired and mean number firing parallel actions



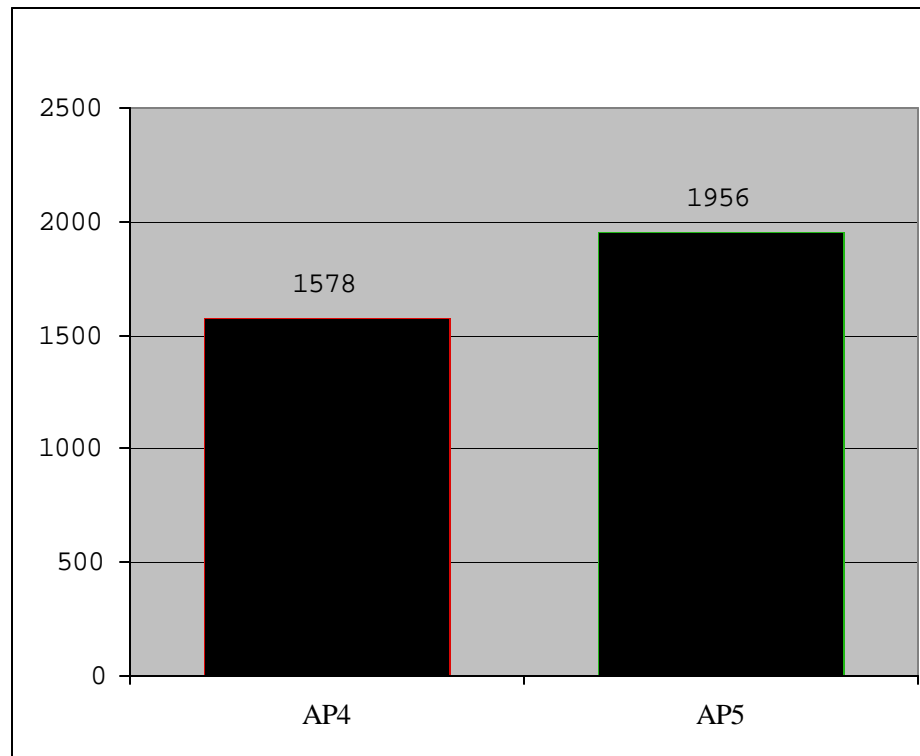
Model Execution

■ Mean number of buffer actions on RHS



Model Execution

- Mean number of new Declarative Memory Elements created



Modeling Dynamic Strategies

- **Target Selection Unit Task**
 - ◆ **Attentional Marking**
 - **(I saw that already? Or did I?)**
 - ◆ **Target Search**
- **Classification Unit Task**
- **Feedback Unit Task**

Target Selection

- **Multiple visual search strategies**
 - ◆ Scan, border, nearest, cluster, random, priority
- **Conflict set resolution**
 - ◆ Lisp function that considers multiple features of environment
 - ◆ Last location
- **Each strategy implemented by feature search**
- **Raises important issues for ACT-R regarding attentional marking**

Attentional Marking (FINST)

- Provides limits on the Vision Module's memory for what has and has not been attended
 - ◆ Unlimited memory size and duration unrealistic
- Why is this important in Argus Prime?
 - ◆ Targets are often revisited
 - ◆ Degree of revisitation varies by
 - Interface condition
 - Search strategy
 - ◆ Requires constant shifts in visual attention, many information fields, 20 targets, etc
- Hard to control both size and duration

Target Search Production

```
(defp search-targ-cluster-in-seg
  =goal>
    isa      cluster-in-seg-search
    step nil
  =visual-state>
    isa      module-state
    modality free
  =retrieval>
    isa      search-parameters
    seg      =seg
  ==>
  +visual-location>
    isa      visual-location
    attended nil
    value    =seg
    nearest  current
    kind     screen-targ
  =goal>
    step     check-result)
```

Classification Unit Task

■ Classification calculation strategies

- ◆ Intermediate results retrieved from declarative memory**
- ◆ Intermediate results stored in goal**
- ◆ Help facility**

Model Subjects vs Human Subjects

- Overall performance
- For each Unit Task look at variety of measures of Quantity and Duration of Interactive performance
- 19 Quantity Measures & 11 Duration Measures have been looked at to date
 - ◆ We will only present the major ones
- Also -- we will focus **ONLY** on differences between Model Subjects and Human Subjects; not on differences between within-subject conditions

Within-Subject Conditions

■ Dot versus noDot

- ◆ If target was already classified, then when it was reselected its threat value would be shown (with a dot) in the information window

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Within-Subject Conditions

■ Dot versus noDot

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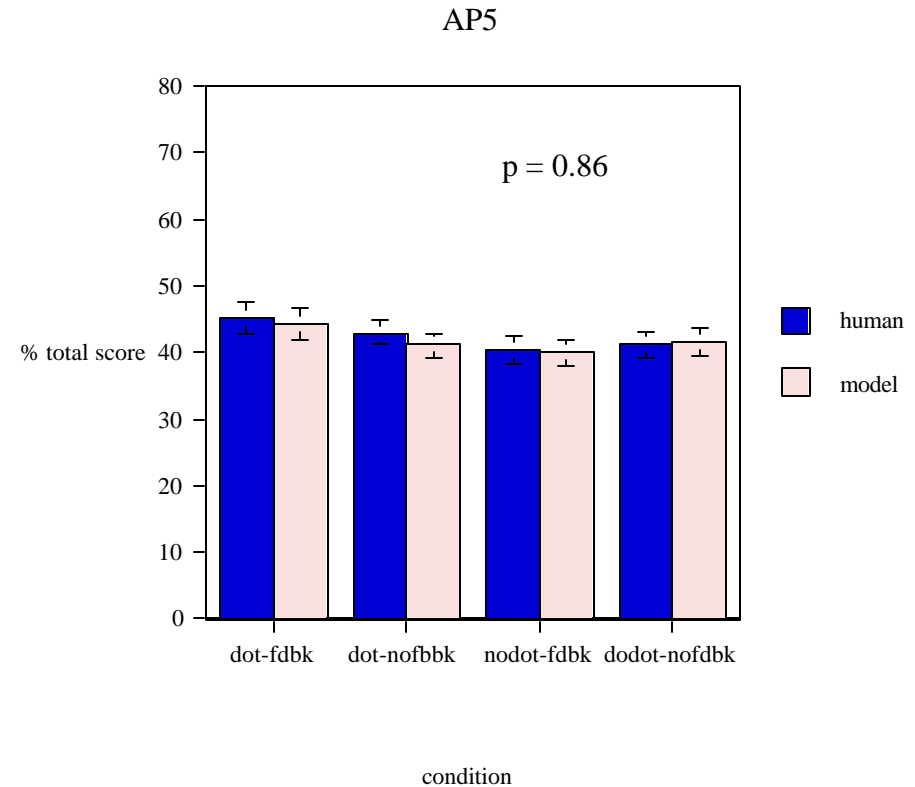
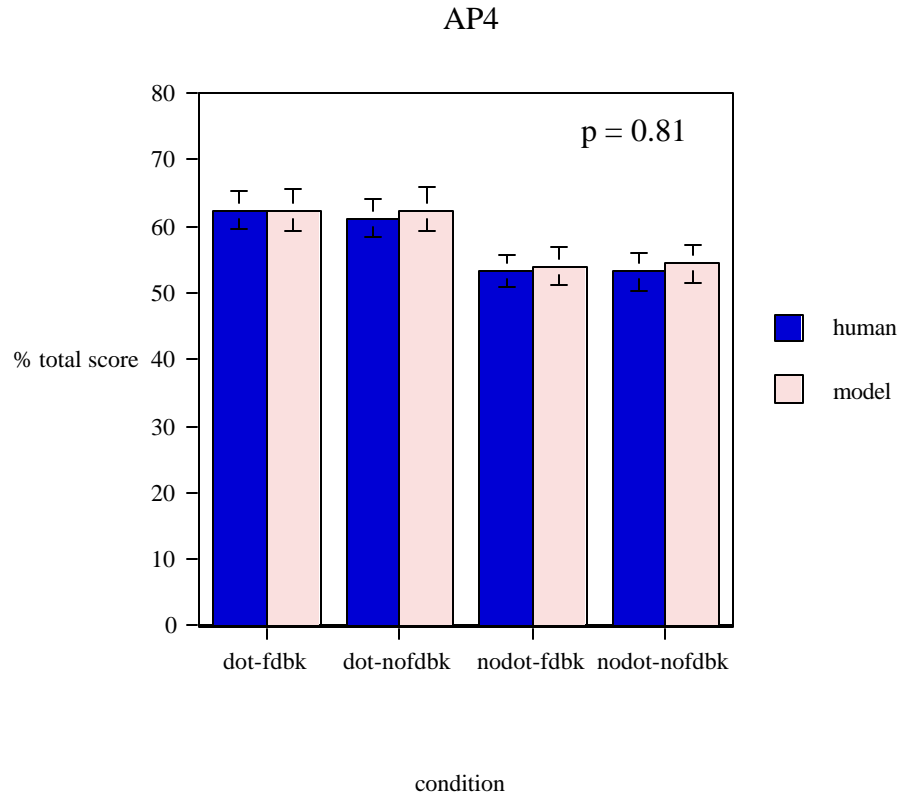
Within-Subject Conditions

■ **Feedback versus no-Feedback**

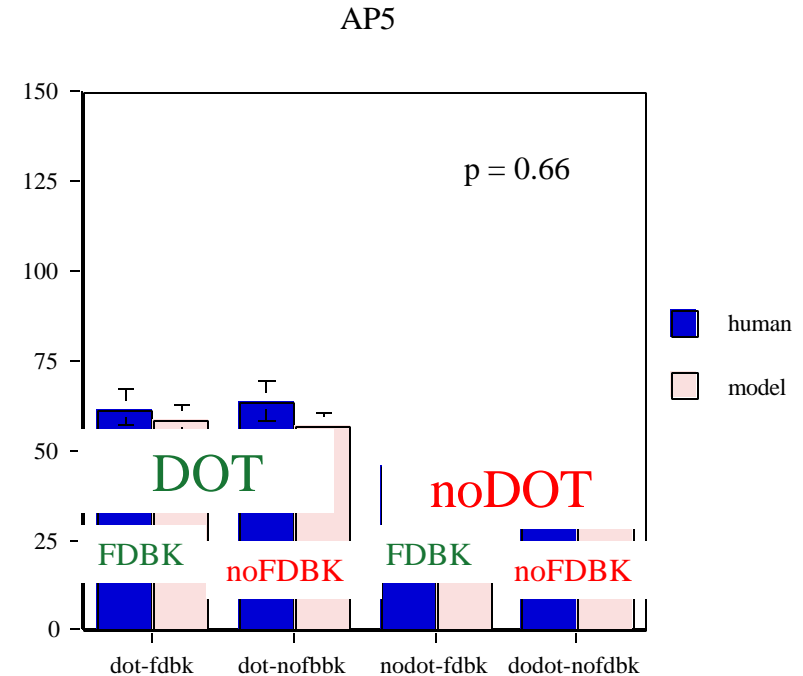
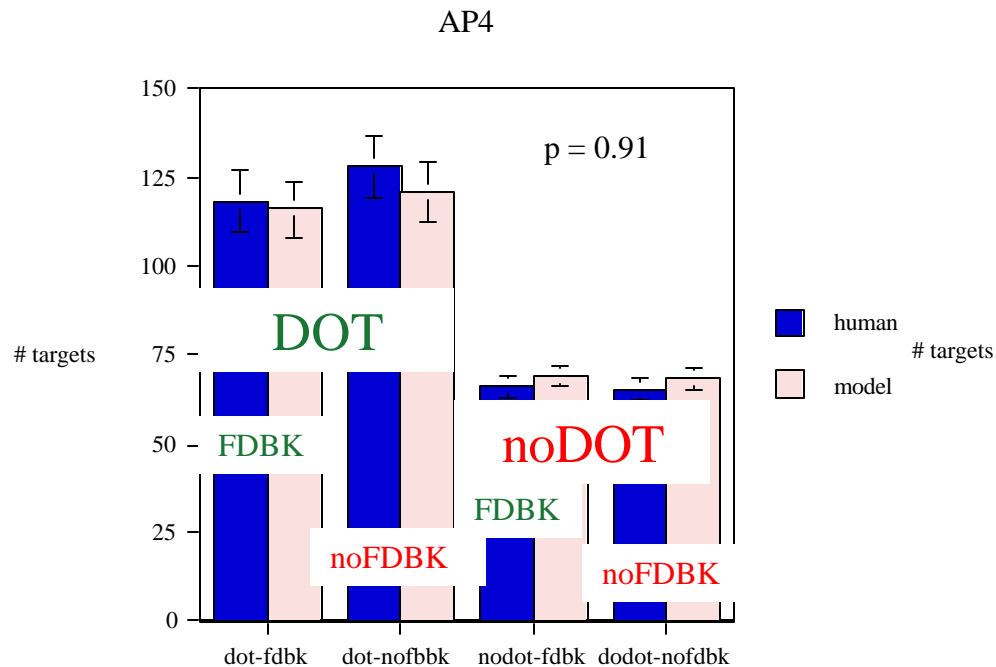
- ◆ **Immediately following classification feedback either was available in a feedback window or was not**



Total Score- Classification Task

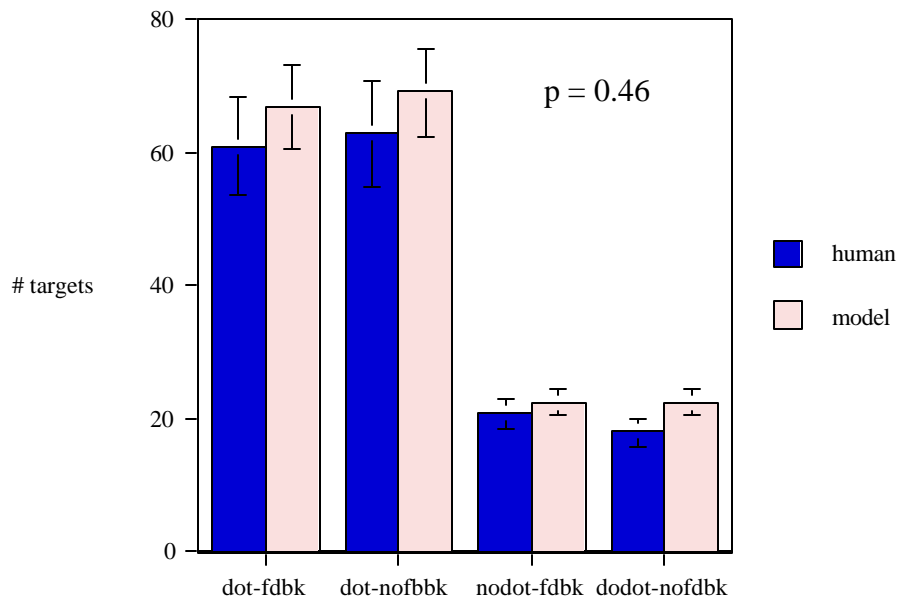


Total # of Target Selections

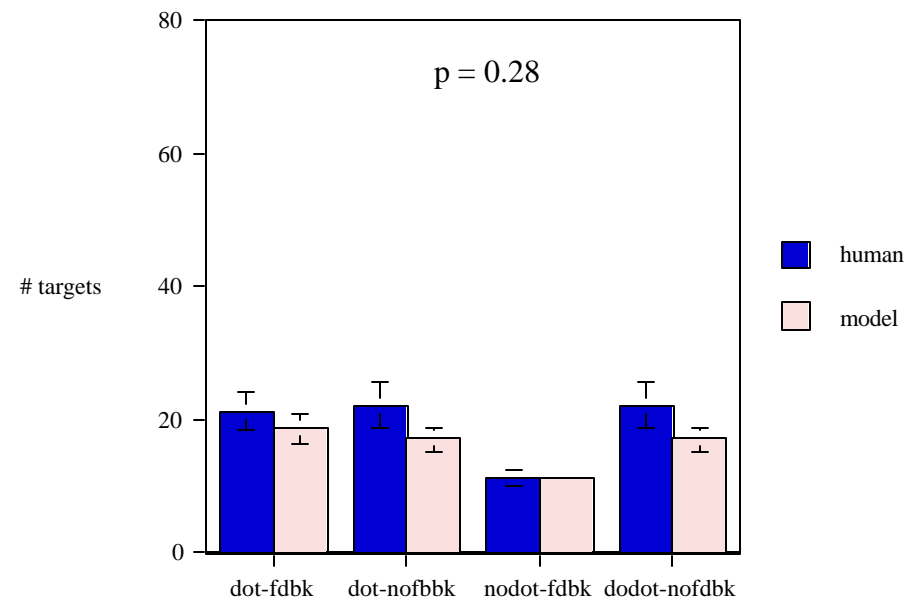


Re-selecting Already Classified Targets

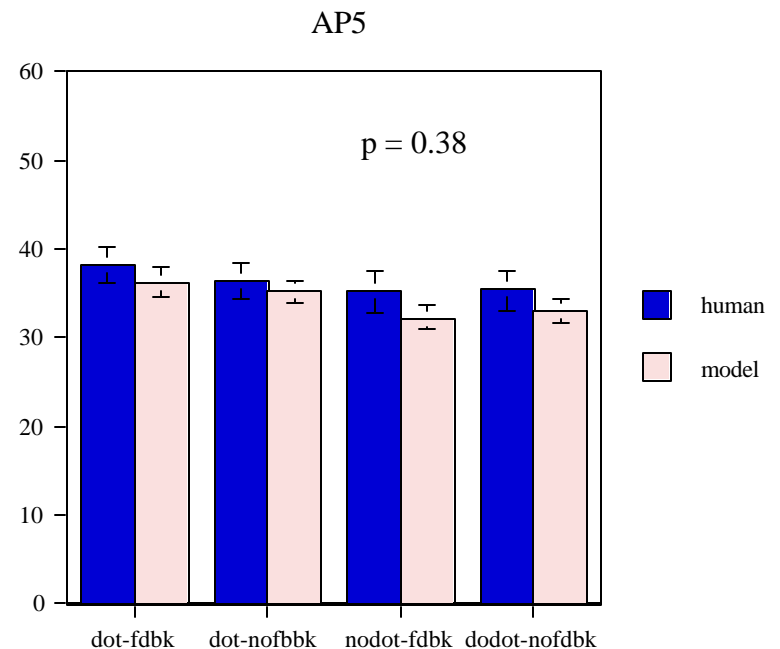
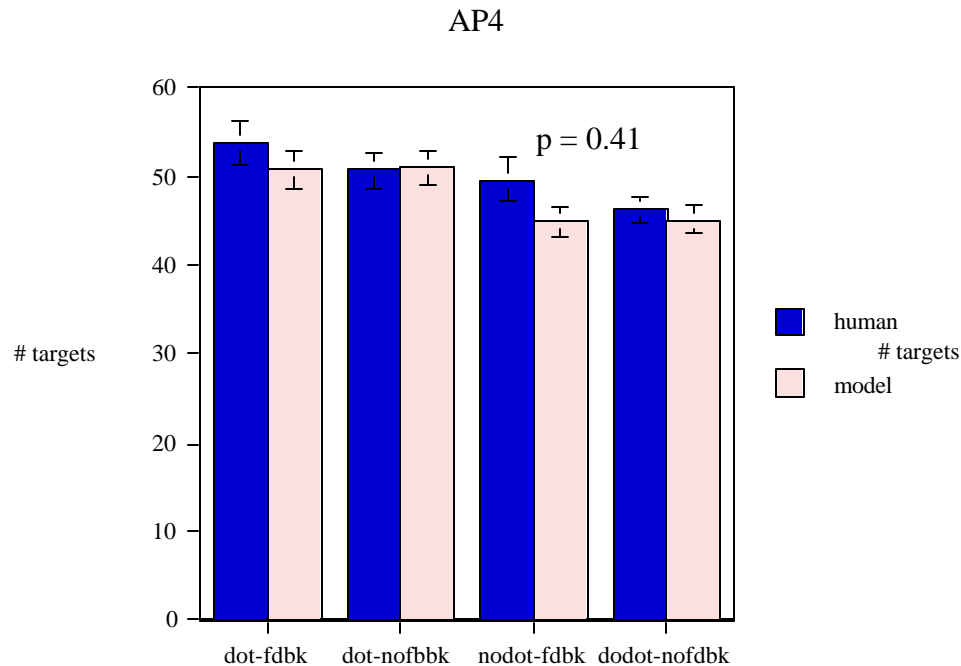
AP4



AP5

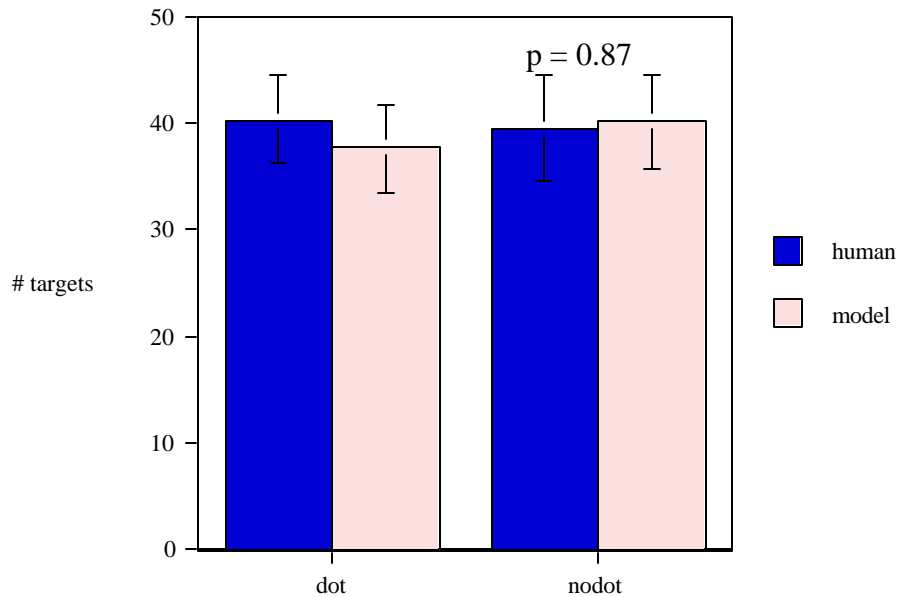


Total # of Classifications

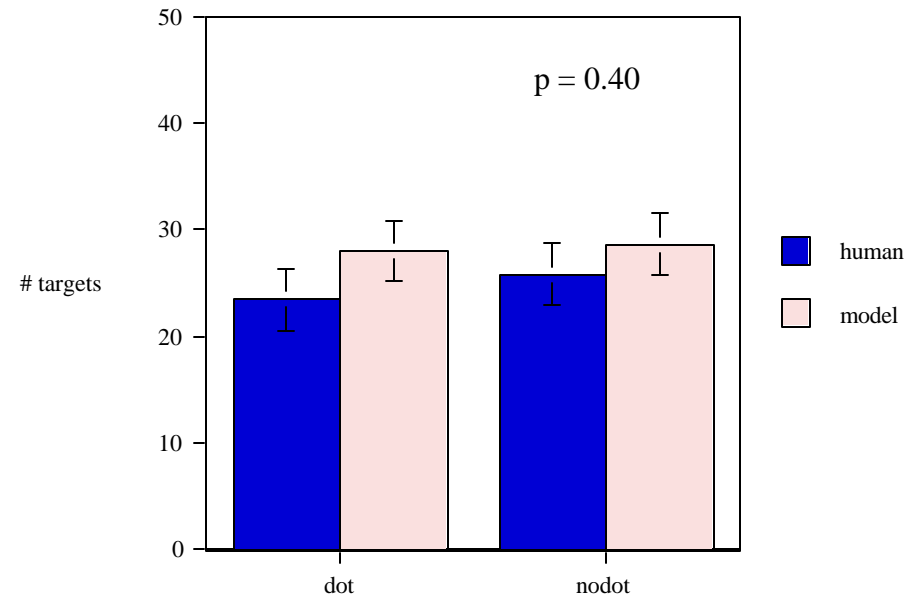


of Feedback Processing

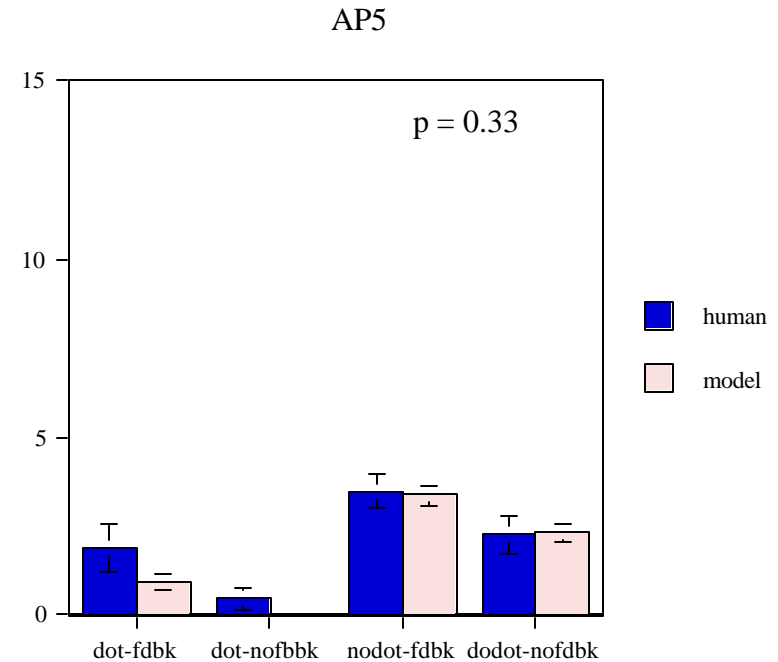
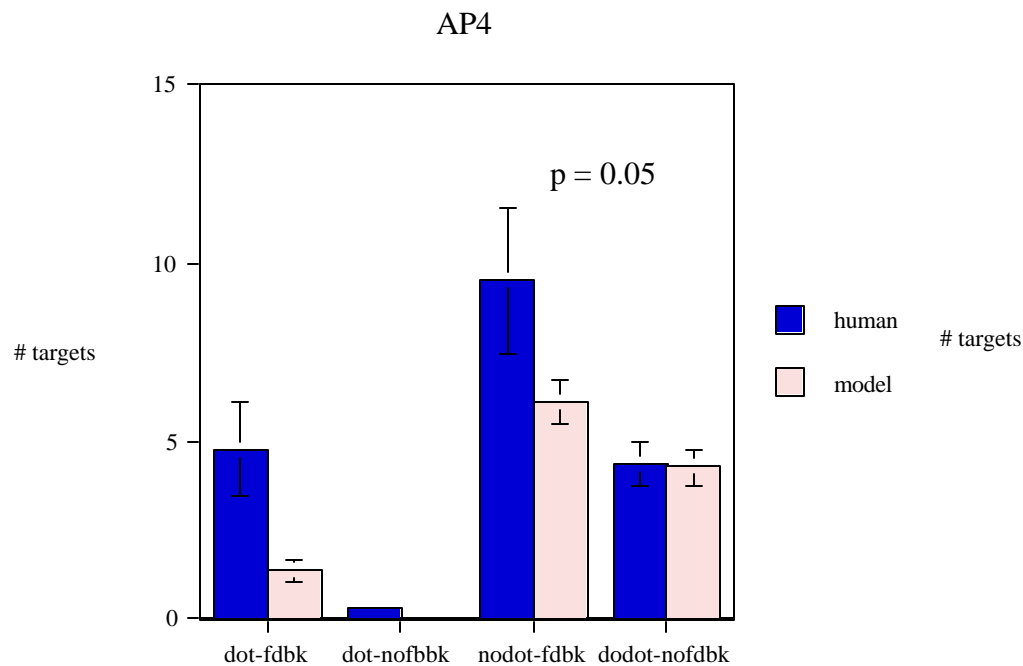
AP4



AP5

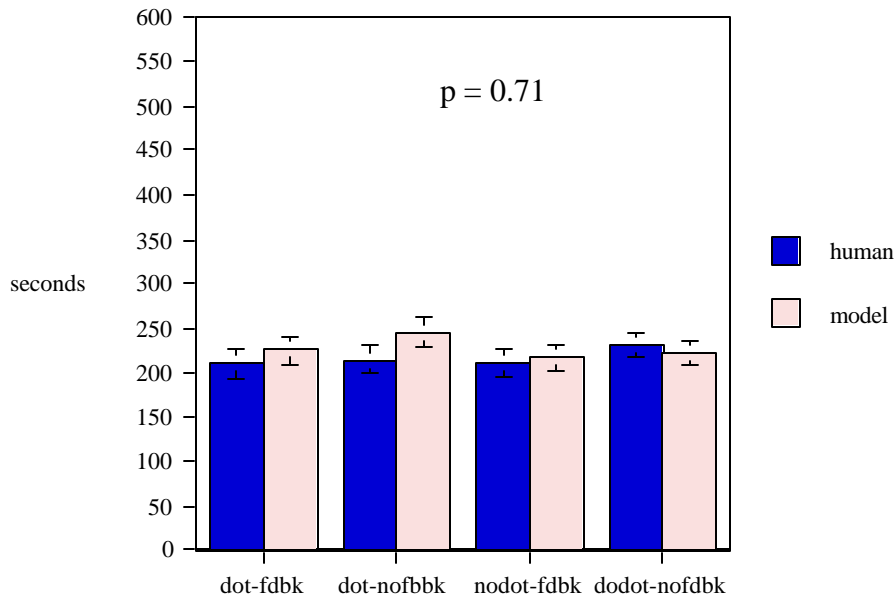


Total Number Reclassified

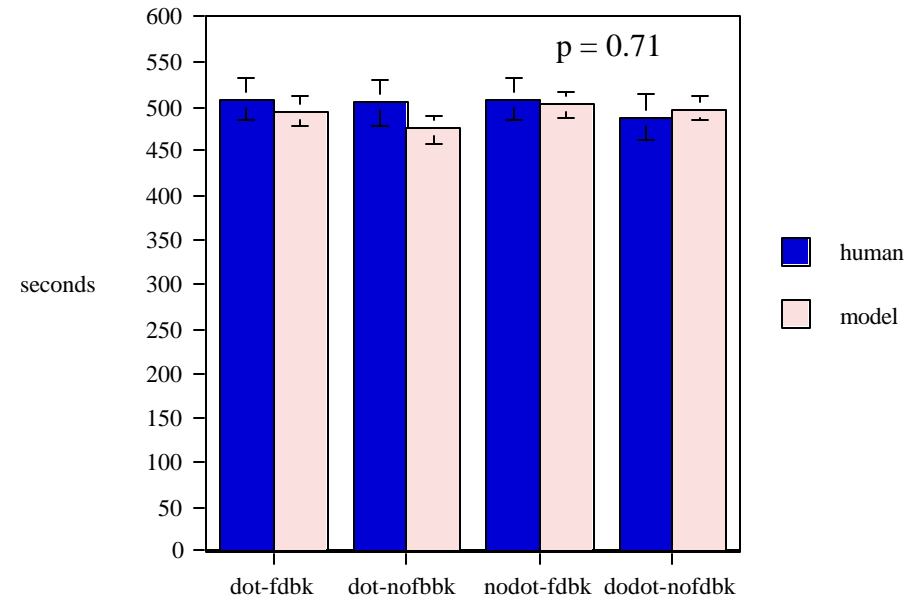


AP5 Tracking Time versus Classification Time

Tracking Time



Classification Time



Unit Task Performance Summary

Unit task	# Performance	# no sig. diff. AP4	# no sig. diff. AP4
Target Selection	5	5	4
Classification	4	4	3
Feedback	3	2	3

Performance measures for Target Selection:

Total targets selected

Number of unclassified targets selected

Number of already classified targets selected

Number of times target was selected but then ignored

Number of targets selected (without use of feedback)

Unit Task Performance Summary

Unit task	# Performance	# no sig. diff. AP4	# no sig. diff. AP5
Target Selection	5	5	4
Classification	4	4	3
Feedback	3	2	3

Performance measures for Classification:

Total classifications

Total correct

Number initially incorrect

Number classifications (no help)

Unit Task Performance Summary

Unit task	# Performance	# no sig. diff. AP4	# no sig. diff. AP5
Target Selection	5	5	4
Classification	4	4	3
Feedback	3	2	3
Tracking	7	n/a	6

Unit task	# Timing	# no sig. diff. AP4	# no sig. diff. AP5
Target Selection	3	1	0
Classification	2	1	2
Feedback	2	0	0
Tracking	4	n/a	4

Conclusion

- **Arguably the worlds most complex ACT-R 5.0 model**
- **Model Subjects based on AP4 predict performance on Classification Task used in AP5**
- **Engineering approach**



ACT-R 5.0 Discussion Issues

- **Downgrading of goal stack**
 - ◆ Subgoals
 - ◆ Parameter passing
- **LISP Package for ACT R 5.0 to avoid symbol conflicts**
- **Dynamic updating of iconic memory**
- **Eye movements to a location with no object present**
 - ◆ (EMMA)
- **Variable Types**
 - ◆ Problem of reuse vs re-creation of productions for low level, fundamental actions such as converting screen-symbols to numeric values.
 - ◆ Sharing of idioms (procedures)

Subgoals & Parameter Passing

- **ACT-R factorial example**
- **ACT-R 5.0 implementation**
- **Argus model idiom**

```

(chunk-type plus-fact addend adder sum)
(chunk-type times-fact multiplicand multiplier product)
(chunk-type factorial argument result)
(add-dm
(0+1=1 isa plus-fact addend 0 adder 1 sum 1)
(1+1=2 isa plus-fact addend 1 adder 1 sum 2)
(2+1=3 isa plus-fact addend 2 adder 1 sum 3)
(1*1=1 isa times-fact multiplicand 1 multiplier 1 product 1)
(1*2=2 isa times-fact multiplicand 1 multiplier 2 product 2)
(2*3=6 isa times-fact multiplicand 2 multiplier 3 product 6)
(fact3 isa factorial argument 3))

```

```

(goal-focus fact3)

```

```

(p base
=goal>
  isa factorial
  argument 0
==>
!output! (The factorial of 0 is 1)
=goal>
  result 1
!pop!)

```

```

(p recurse
=goal>
  isa factorial
  argument =n
  result nil
=fact>
  isa plus-fact
  addend =n-1
  adder 1
  sum =n
==>
!output! (Subgoal the factorial of =n-1)
=subgoal>
  isa factorial
  argument =n-1
  result =result
=goal>
  result =result
!push! =subgoal)

```

```

(p compute
=goal>
  isa factorial
  argument =n
  result =fact-n-1
=fact>
  isa times-fact
  multiplicand =fact-n-1
  multiplier =n
  product =fact-n
==>
!output! (Computing the factorial of =n as =fact-n)
=goal>
  result =fact-n
!pop!)

```

```
(chunk-type factorial argument result step next)
(P base
 "base"
=goal>
  ISA      factorial
  argument  0
  next      =parentgoal
==>
!output!    ( the factorial of 0 is 1)
=parentgoal>
  ISA      factorial
  result    1
+goal>      =parentgoal)
```

```
(P recurse
 "recurse"
=goal>
  ISA      factorial
  argument  =n
  result    nil
  step      nil
==>
=goal>
  step      retrieving
+retrieval>
  ISA      plus-fact
  adder     1
  sum       =n)
```

```
(P recurse-retrieve
 "recurse-retrieve"
=goal>
  ISA      factorial
  argument  =n
  result    nil
=retrieval>
  ISA      plus-fact
  addend    =n-1
  adder     1
  sum       =n
==>
!output!    ( subgoaling the factorial of =n-1)
=goal>
  step      nil
+goal>
  ISA      factorial
  argument  =n-1
  next      =goal)
```

```
(P compute
=goal>
  ISA      factorial
  argument  =n
  result    =fact-n-1
  step      nil
==>
=goal>
  step      computing
+retrieval>
  ISA      times-fact
  multiplicand =fact-n-1
  multiplier  =n)
```

```
(P compute-retrieve
=goal>
  ISA      factorial
  argument  =n
  result    =fact-n-1
  next      =parentgoal
  step      computing
=retrieval>
  ISA      times-fact
  multiplicand =fact-n-1
  multiplier  =n
  product     =fact-n
==>
!output!    ( computing the factorial of =n as =fact-n)
=parentgoal>
  ISA      factorial
  result    =fact-n
+goal>      =parentgoal)
```

```
(P compute-done
=goal>
  ISA      factorial
  argument  =n
  result    =fact-n-1
  next      nil
  step      computing
=retrieval>
  ISA      times-fact
  multiplicand =fact-n-1
  multiplier  =n
  product     =fact-n
==>
!output!    ( computing the factorial of =n as =fact-n)
=goal>
  step      done)
```

Idiom used in Argus Model

```
(deftype parentgoal result)
(deftype subgoal next)
(deftype (parent&subgoal (:include parentgoal)) next)
(deftype (chk-tot-% (:include subgoal)))
(deftype (select-target (:include parentgoal)) step init-targ reclass loc)
(deftype (compare-% (:include parent&subgoal)) step class track)
(defp chk-tot-%-3
  =goal>
    isa      chk-tot-%
    step     look-at-tot%
  next  =newgoal
  =visual-state>
    isa      module-state
    modality  free
  =visual>
    isa      Fdbk-txt
    val      =txt
  ==>
  =newgoal>
    isa      parentgoal
    result   =txt
  +goal>    =newgoal)
```

Model Parameters

■ Perceptual

◆ Visual attention latency = 0.85

■ Source: default

◆ Number of FINSTS = 100

◆ FINST span = 20

◆ Onset span = 5.0

■ Motor

◆ defaults

Model Parameters

■ **Cognitive**

- ◆ **Base level learning (:bll) = 0.5**
 - **Source: de facto default**
- ◆ **Activation noise (:ans) = 0.25**
 - **Source: near de facto default**
- ◆ **Latency factor (:lf) = 0.05**
 - **Source: ACT-R list**
- ◆ **Expected gain noise (:egs) = 0.20**
 - **Source: ??**